# Quantum Chemistry Algorithms: Classical vs Quantum



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Why?

#### I. Curiosity

"A Quantum machine may be more efficient at simulating a quantum system than a classical machine."



Feynman

Why?

- I. Curiosity
- 2. Difficulty



"The fundamental laws necessary for the mathematical treatment of a large part of physics and the whole of chemistry are thus completely known, and the difficulty lies only in the fact that application of these laws leads to equations that are too complex to be solved."

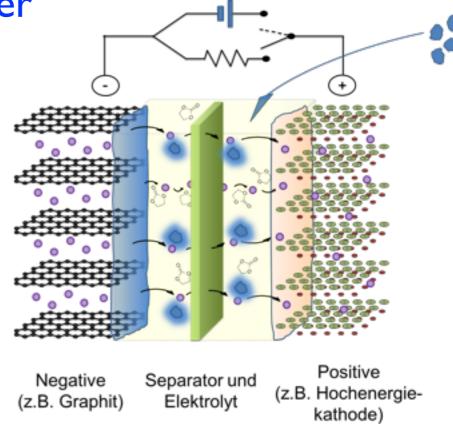
$$i\hbar \frac{\partial \Psi}{\partial t} = \hat{H}\Psi$$

Dirac

### Why?

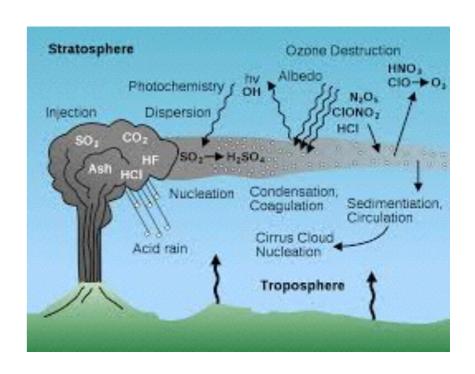
- I. Curiosity
- 2. Difficulty
- 3. Importance









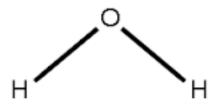


## Quantum Chemistry Programs on CPUs (80 and counting)

Package ¢	License <sup>†</sup> ¢	Language ¢	Basis •	Periodic <sup>‡</sup>	Mol. mech.	Semi-emp. •	HF ♦	Post-HF •	DFT ¢	GPU •
ABINIT	GPL	Fortran	PW	3d	Yes	No	No	No	Yes	Yes
ACES II	GPL	Fortran	GTO	No	No	No	Yes	Yes	Yes	
ACES III	GPL	Fortran/C++	GTO	No	No	No	Yes	Yes	No	Yes
ADF	Commercial	Fortran	STO	Any	Yes	Yes <sup>4</sup>	Yes	No	Yes	
Atomistix ToolKit (ATK)	Commercial	C++/Python	NAO/EHT	3d <sup>9</sup>	Yes	Yes	No	No	Yes	
BigDFT	GPL	Fortran	Wavelet	Any	Yes	No	Yes	No	Yes	Yes
CADPAC	Academic	Fortran	GTO	No	No	No	Yes	Yes	Yes	
CASINO (QMC)	Academic	Fortran 95	GTO / PW / Spline / Grid / STO	Any	No	No	Yes	Yes	No	
CASTEP	Academic (UK) / Commercial	Fortran	PW	3d	Yes	No	Yes <sup>5</sup>	No	Yes	
CFOUR	Academic	Fortran	GTO	No	No	No	Yes	Yes	No	
COLUMBUS	Academic	Fortran	GTO	No	No	No	Yes	Yes	No	
CONQUEST	Academic	Fortran 90	NAO/Spline	3d	Yes	No	Yes <sup>5</sup>	No	Yes	
CP2K	GPL	Fortran 95	Hybrid GTO / PW	3d	Yes	Yes	Yes	Yes	Yes	Yes
CPMD	Academic	Fortran	PW	3d	Yes	No	Yes	No	Yes	
CRYSTAL	Academic (UK) / Commercial	Fortran	GTO	Any	Yes	No	Yes	Yes <sup>10</sup>	Yes	
DACAPO	GPL? <sup>1</sup>	Fortran	PW	3d	Yes	No	No	No	Yes	
DALTON	Academic	Fortran	GTO	No	No	No	Yes	Yes	Yes	
DFTB+₽	Academic / Commercial	Fortran 95	NAO	Any	Yes	Yes	No	No	No	
DFT++₽	GPL	C++	PW / Wavelet	3d	Yes	No	No	No	Yes	
DIRAC	Academic	Fortran 77, Fortran 90, C	GTO	No	No	No	Yes	Yes	Yes	
DMol3	Commercial	Fortran 90	NAO	Any	No	No	No	No	Yes	
ELK	GPL	Fortran 95	FP-LAPW	3d	No	No	Yes	No	Yes	
Empire 🛭	Academic / Commercial	Fortran	Minimal STO	Any	No	Yes	No	No	No	
ErgoSCF €	GPL	C++	GTO	No	No	No	Yes	No	Yes	
ERKALE 🚱	GPL	C++	GTO	No	No	No	Yes	No	Yes	
EXCITING	GPL	Fortran 95	FP-LAPW	3d	No	No	Yes	No	Yes	
FLEUR @	Academic	Fortran 95	FP-(L)APW+lo	3d, 2d, 1d	No	No	Yes	Yes	Yes	
FHI-aims 🚱	Commercial	Fortran	NAO	Any	Yes	No	Yes	Yes	Yes	
FreeON	GPL	Fortran 95	GTO	Any	Yes	No	Yes	Yes	Yes	
Firefly / PC GAMESS	Academic	Fortran, C, Assembly	GTO	No	Yes <sup>3</sup>	Yes	Yes	Yes	Yes	Yes
GAMESS (UK)	Academic (UK) / Commercial	Fortran	GTO	No	No	Yes	Yes	Yes	Yes	Yes
GAMESS (US)	Academic	Fortran	GTO	No	Yes <sup>2</sup>	Yes	Yes	Yes	Yes	Yes
Gaussian	Commercial	Fortran	GTO	Any	Yes	Yes	Yes	Yes	Yes	
GPAW ₽	GPL	Python / C	Grid / NAO / PW	3d	Yes	No	Yes <sup>5</sup>	No	Yes	Yes
HILAPW ₽	Unknown	Unknown	FLAPW	3d	No	No	No	No	Yes	
Jaguar	Commercial	Fortran / C	GTO	No	Yes	No <sup>11</sup>	Yes	Yes	Yes	

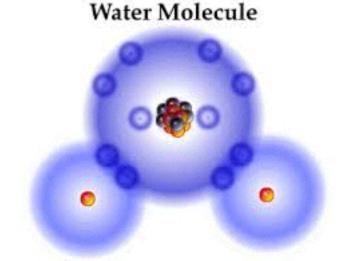
$$\hbar = 4\pi\epsilon_0 = m_e = e = 1$$

Schrödinger Equation 
$$i \frac{\partial \Psi}{\partial t} = \hat{H} \Psi$$



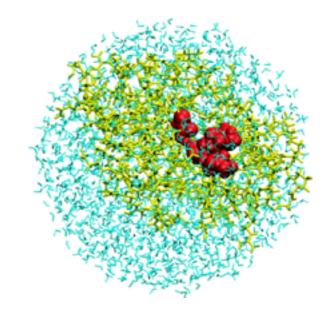
$$\hat{H} = -\sum_{i} \frac{1}{2m_i} \nabla_i^2 + \sum_{i>j} \frac{Z_i Z_j}{r_{ij}}$$

$$\Psi(\mathbf{r}_1,\mathbf{r}_2,\ldots,\mathbf{r}_n,\mathbf{R}_1,\mathbf{R}_2,\ldots,\mathbf{R}_N,t)$$



Water: N = 3 n = 10

Protein: N = 10000 n = 50000



$$i\frac{\partial\Psi}{\partial t} = \hat{H}\Psi$$

$$\hat{H} = -\sum_{i} \frac{1}{2m_i} \nabla_i^2 + \sum_{i>j} \frac{Z_i Z_j}{r_{ij}}$$

$$\Psi(\mathbf{r}_1, \mathbf{r}_2, \dots, \mathbf{r}_n, \mathbf{R}_1, \mathbf{R}_2, \dots, \mathbf{R}_N, t)$$



some steps

$$\hat{H}|\psi\rangle = E|\psi\rangle$$

$$\hat{H} = \sum_{pq} h_{pq} a_p^{\dagger} a_q + \sum_{pqrs} g_{pqrs} a_p^{\dagger} a_q^{\dagger} a_r a_s$$

$$|\psi\rangle = \sum_{P} C_P |P\rangle$$

Step I. Adiabatically separate electronic and nuclear motion

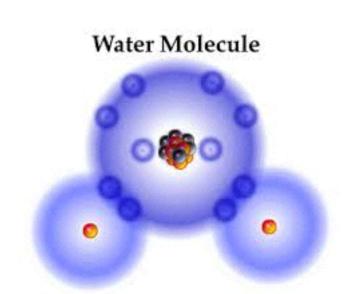
$$\Psi(\mathbf{r}, \mathbf{R}, t) \to \psi_e(\mathbf{r}; \mathbf{R}) \psi_n(\mathbf{R}, t)$$

Yields the time-independent Schrödinger Equation for the electrons

$$\hat{H}\Psi = E\Psi$$

$$\hat{H} = -\frac{1}{2} \sum_{i} \nabla_{i}^{2} - \sum_{I,i} \frac{Z_{I}}{r_{iI}} + \sum_{i>j} \frac{1}{r_{ij}}$$

$$\Psi(\mathbf{r}_1,\mathbf{r}_2,\ldots,\mathbf{r}_n)$$



Step 2. Select a (finite) basis of I-p functions (LCAO, PW)

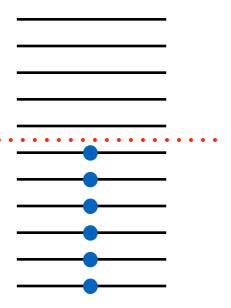
$$\chi_{\mu}(\mathbf{r}) = x^i y^j z^k e^{-\alpha r^2}$$
  $\phi_p(\mathbf{r}) = \sum_{\mu} c_{\mu p} \chi_{\mu}(\mathbf{r})$ 

Mean field approximation (independent particle model)

$$\psi_{\text{HF}}(\mathbf{r}_1, \mathbf{r}_2, \dots, \mathbf{r}_n) = \hat{\mathcal{A}} \prod_i \phi_i(\mathbf{r}_i)$$
$$\hat{F}\phi_p(\mathbf{r}) = \varepsilon_p \phi_p(\mathbf{r})$$

Defines a set of one-particle states and an n-particle Hilbert space

$$\hat{H} = \sum_{pq} h_{pq} a_p^{\dagger} a_q + \sum_{pqrs} g_{pqrs} a_p^{\dagger} a_q^{\dagger} a_r a_s$$



#### Step 3. Find the eigenstates

$$\hat{H}|\psi\rangle = E|\psi\rangle \qquad \qquad \hat{H} = \sum_{pq} h_{pq} a_p^{\dagger} a_q + \sum_{pqrs} g_{pqrs} a_p^{\dagger} a_q^{\dagger} a_r a_s$$

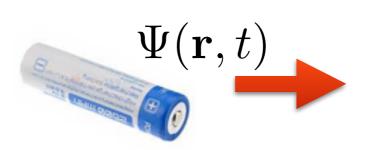
Dimension of n-p Hilbert space is combinatorial in the number of electrons (n) and available I-p states (m)

$$|\psi\rangle = \sum_{P} C_P |P\rangle \qquad \begin{pmatrix} m \\ n \end{pmatrix}$$

Water:  $m = 30 n = 10 : 10^{10}$ 

Protein:  $m = 150000 \ n = 50000 \ : 10^{10000}$ 

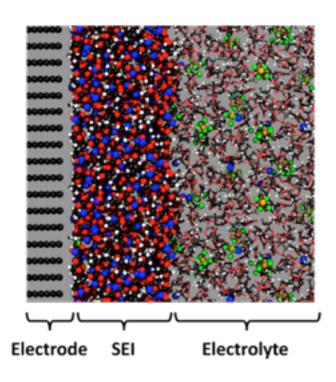
#### Three layers of approximation



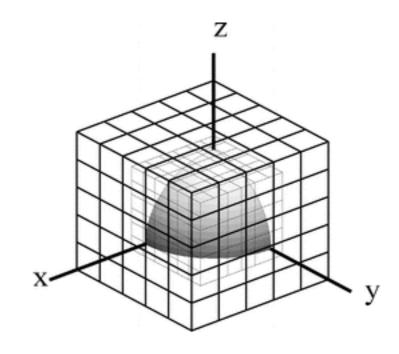


# Simulation window





I-p Representation cut-off



basis set incompleteness

# n-p Representation cut-off

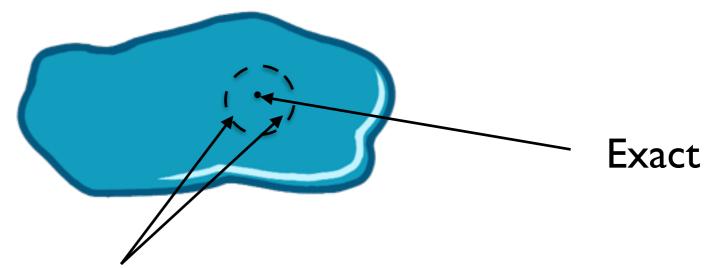
$$\hat{H}|\psi\rangle = E|\psi\rangle$$

$$|\psi\rangle = \sum_{P} C_P |P\rangle$$

polynomial number of parameters

#### Step 3. Find approximations to the eigenstates

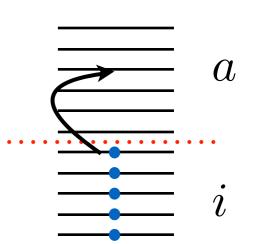
$$\hat{H}|\psi\rangle = E|\psi\rangle \qquad \qquad \hat{H} = \sum_{pq} h_{pq} a_p^{\dagger} a_q + \sum_{pqrs} g_{pqrs} a_p^{\dagger} a_q^{\dagger} a_r a_s$$



- ullet  $E+\epsilon$  is acceptable
- ullet Provided  $\epsilon/n<$  "Chemical accuracy"

#### Classical Algorithm 1: Coupled Cluster

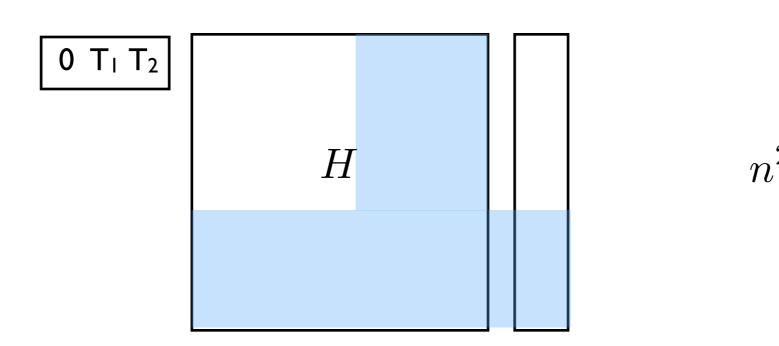
$$\hat{H} = \sum_{pq} h_{pq} a_p^{\dagger} a_q + \sum_{pqrs} g_{pqrs} a_p^{\dagger} a_q^{\dagger} a_r a_s$$



Factorised many-body expansion

$$|\psi\rangle = e^T|0\rangle$$
 
$$T = \sum_{ai} t_i^a a_a^{\dagger} a_i + \sum_{abij} t_{ij}^{ab} a_a^{\dagger} a_j^{\dagger} a_j$$

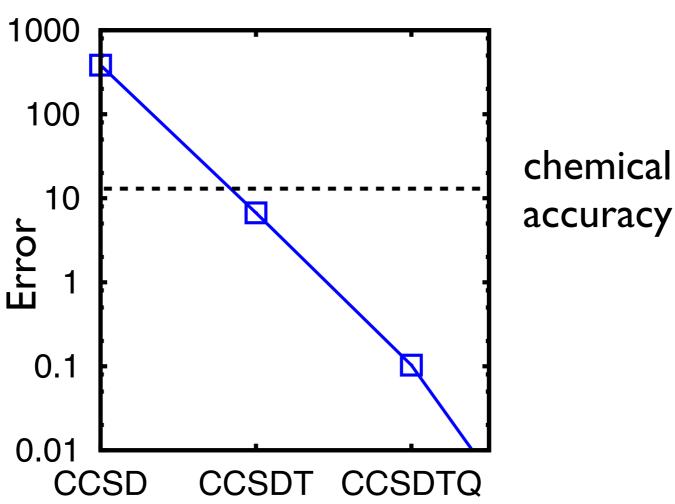
• Obtain energy and coefficients via projection (like PT)



#### Classical Algorithm 1: Coupled Cluster

For many cases, convergence with respect to truncation of manybody expansion is near exponential

$$|\psi\rangle = e^{T_1 + T_2 + T_3 + \dots} |0\rangle$$



accuracy

#### Coupled Cluster State of the art

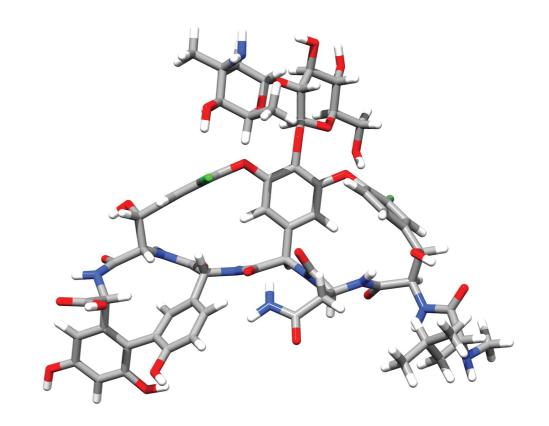
• For insulators, the interactions are short range: polynomial number of parameters and operations: O(n)

m > 8800

n > 900

N > 450

time 10<sup>6</sup> seconds (2 weeks, I CPU)

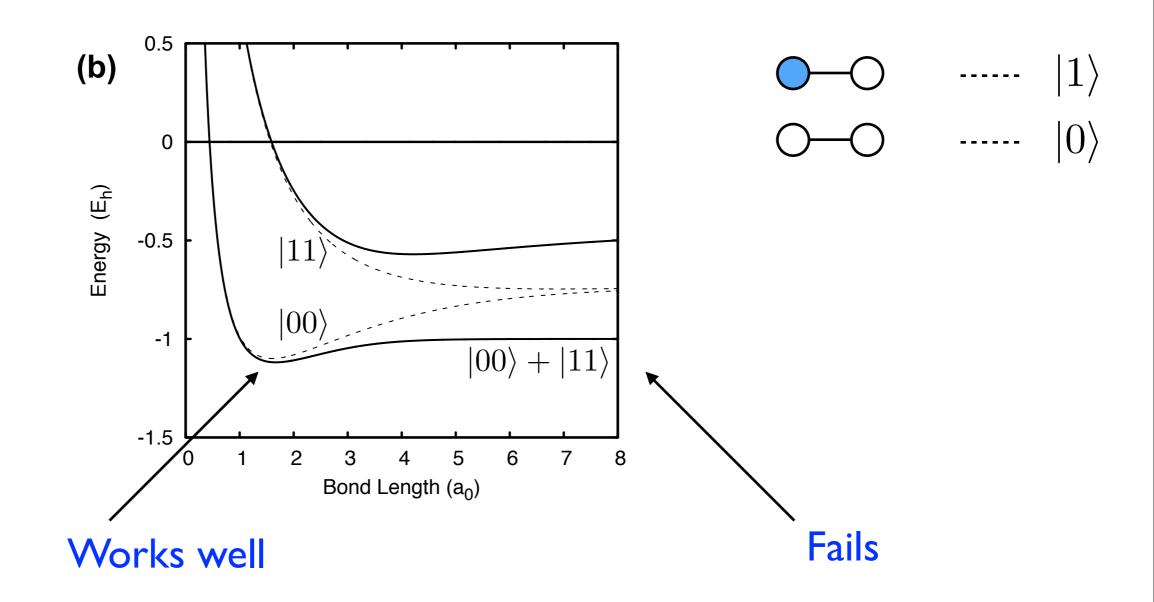


Chemical accuracy for e.g. binding energies

#### Coupled Cluster success and failure

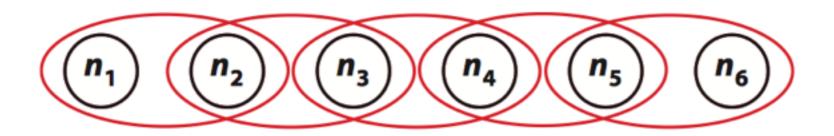
Simple example of H<sub>2</sub> with varying bond length





#### Classical Algorithm 2: DMRG

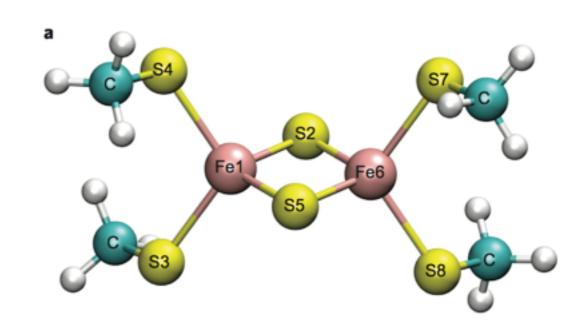
#### Tensor train factorisation of the CI vector



$$C_{DMRG}^{n_1 n_2 n_3 n_4} = \sum_{i_1 i_2 i_3 \dots}^{M} A_{i_1}^{n_1} A_{i_1 i_2}^{n_2} A_{i_2 i_3}^{n_3} A_{i_3 i_4 \dots}^{n_4}$$

State-of-the-art

 $m = 64 n = 30 : 10^{17}$ 



#### Classical Algorithm 3: FCI-QMC

A stochastic realisation of the imaginary-time Schrödinger Equation in n-particle Hilbert-space

$$i\frac{\partial\Psi}{\partial t} = \hat{H}\Psi$$
 
$$\frac{\partial\Psi}{\partial\tau} = -\hat{H}\Psi$$

The CI coefficients are represented through a population of walkers in Hilbert space. After reaching steady state, energies and properties are extracted through time-averaging

$$-\frac{\partial C_P}{\partial \tau} = (H_{PP} - E)C_P + \sum_{Q \neq P} H_{PQ}C_Q$$

State-of-the-art :  $> 10^{20}$ 

#### Classical Algorithm 4: Density Functional Theory

There is an existence proof that there is a one-to-one mapping between the wave function and the electron density

$$\psi(\mathbf{r}_1,\mathbf{r}_2,\ldots,\mathbf{r}_n)\leftrightarrow\rho(\mathbf{r})$$

$$\min_{\rho} E[\rho]$$
 for n-representable densities

Kohn-Sham: search over non-interacting mean-field states

$$\hat{\mathcal{A}} \prod_{i} \phi_i(\mathbf{r}_i) \to \rho(\mathbf{r})$$

$$E[\rho] = T_s + V[\rho] + J[\rho] + V_{xc}[\rho]$$

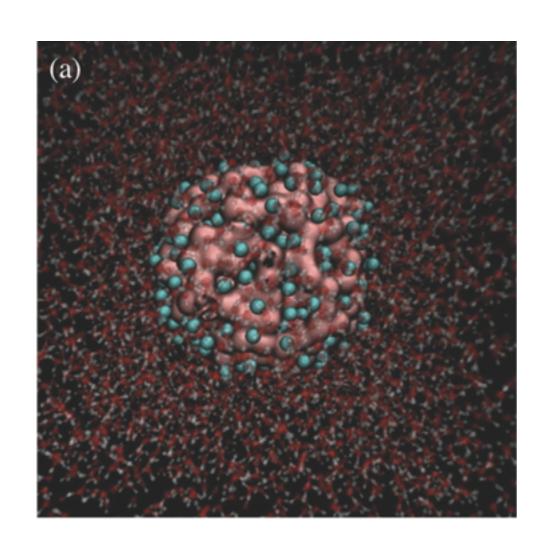
## Approximate Density Functionals in G09

EXCHANGE	CORRELATION	EXCHANGE ONLY	PURE	HYBRID	RANGE-SEPARATED HYBRID				
S	VWN	HFS	VSXC	<b>B3LYP</b>	HSEH1PBE				
XA	VWN5	XAlpha	<b>HCTH</b>	B3P86	OHSE2PBE				
В	LYP	HFB	HCTH93	<b>B3PW91</b>	OHSE1PBE				
PW91	$\mathbf{PL}$		<b>HCTH147</b>	B1B95	wB97XD				
mPW	P86		<b>HCTH407</b>	mPW1PW91	wB97				
<b>G96</b>	PW91		tHCTH	mPW1LYP	wB97X				
PBE	B95		M06L	mPW1PBE	LC-wPBE				
O	PBE		<b>B97D</b>	mPW3PBE	CAM-B3LYP				
TPSS	TPSS		B97D3	<b>B98</b>	HISSbPBE				
BRx	KCIS		SOGGA11	<b>B971</b>	M11				
<b>PKZB</b>	BRC		M11L	<b>B972</b>	N12SX				
wPBEh	PKZB		N12	PBE1PBE	MN12SX				
<b>PBEh</b>	<b>VP86</b>		MN12L	<b>B1LYP</b>					
	V5LYP			O3LYP					
				BHandH					
LONG RANGE				BHandHLYP					
CORRECTION				BMK					
LC-				M06					
				M06HF					
		M062X							
		tHCTHhyb							
		APFD							
		APF							
			SOGGA11X						
			PBEh1PBE						
				TPSSh					
				X3LYP					

#### State-of-the-art for DFT

Accuracy - twice "Chemical Accuracy" if the molecule under investigation resembles those the functionals were parameterised to get right. Else ...

(Important, but shrinking, class of problems for which DFT fails)



N = 16000

m = 100000

n = 50000

1000 time steps

Blue Gene/Q

#### Summary

For a wide class of molecules, the electronic structure of the undistorted ground state is relatively easy. Weakly correlated.

DFT and CCSD(T) hit different sweet spots of accuracy vs cost

An important class of systems have difficult electronic structure, usually characterised by many degenerate or near degenerate states and a poor mean field solution.

Strongly correlated.

We don't know how to solve these problems efficiently and reliably.

Exploit the mapping of Fermionic creation and annihilation operators onto qubit operations

$$\hat{H} = \sum_{pq} h_{pq} a_p^{\dagger} a_q + \sum_{pqrs} g_{pqrs} a_p^{\dagger} a_q^{\dagger} a_r a_s$$

Unitary-type operations can be used to prepare a state, perform QFT, and evolve a state according to a Hamiltonian

$$|\psi\rangle = U|0\rangle \qquad e^{i\hat{H}t}|\psi\rangle$$

Trotter expansion makes it possible to decompose general angle unitaries from  $e^{i\hat{H}t}$  into a sequence of local angle unitaries.

#### Quantum Algorithm 1: Phase Estimation

Prepare 
$$|\psi\rangle=U|0\rangle$$

 $\begin{array}{c} {\bf QFT} \\ E \end{array}$ 

Requires that  $|\psi\rangle$  has a large overlap with the true eigenstate For the easy cases, where CC works, this is probably possible Open question: How to prepare good states for hard cases?

Prepare  $|0\rangle$ 

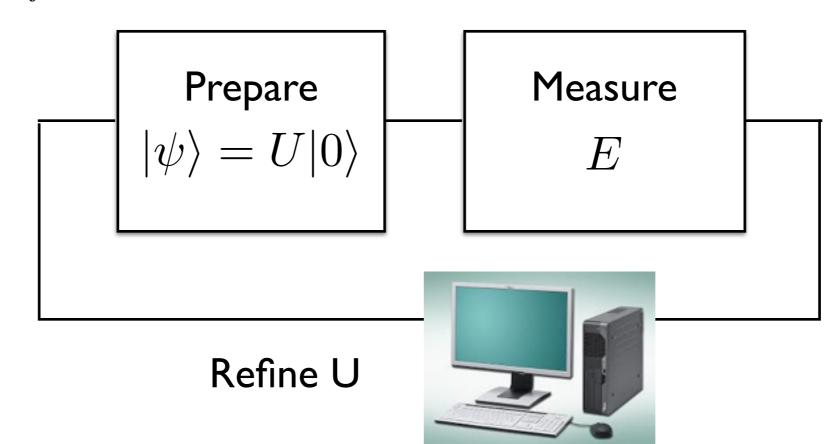
Adiabatic map  $e^{i((1-t)\hat{F}+t\hat{H})}|0\rangle$ 

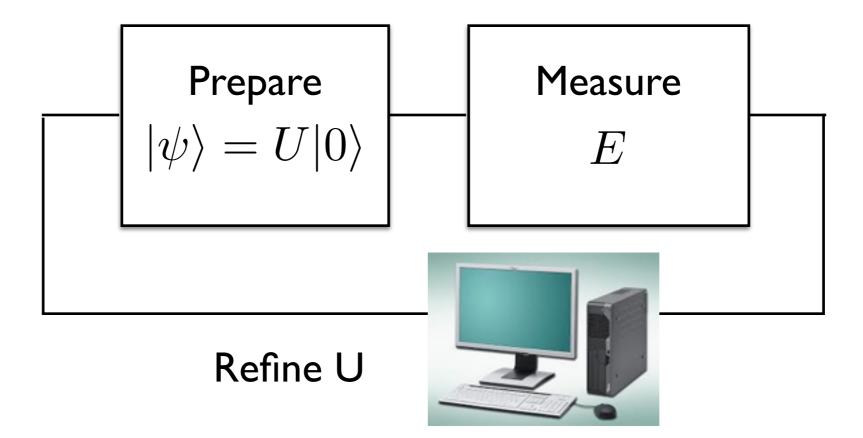
QFT E

Decompose the Hamiltonian into a sum of unitary operations

$$\hat{H} = \sum_{pq} h_{pq} a_p^{\dagger} a_q + \sum_{pqrs} g_{pqrs} a_p^{\dagger} a_q^{\dagger} a_r a_s$$

$$= \sum_{i} c_i U_i$$





We will only have access to a limited space of unitaries

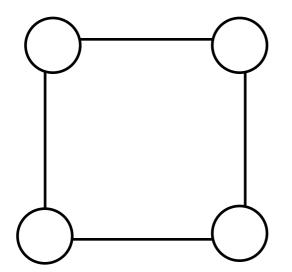
$$U = e^{\hat{T} - \hat{T}^{\dagger}}$$

#### Questions:

Is unitary truncated coupled cluster better than regular?

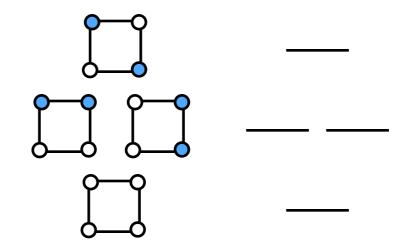
How easy or hard is the refinement of U?

Numerical experiments for a 1-d periodic Hubbard Hamiltonian



$$\hat{H} = -t \sum_{\langle i,j \rangle \sigma} a_{i\sigma}^{\dagger} a_{j\sigma} + U \sum_{i} n_{i\uparrow} n_{i\downarrow}$$

4 I-particle states for each spin

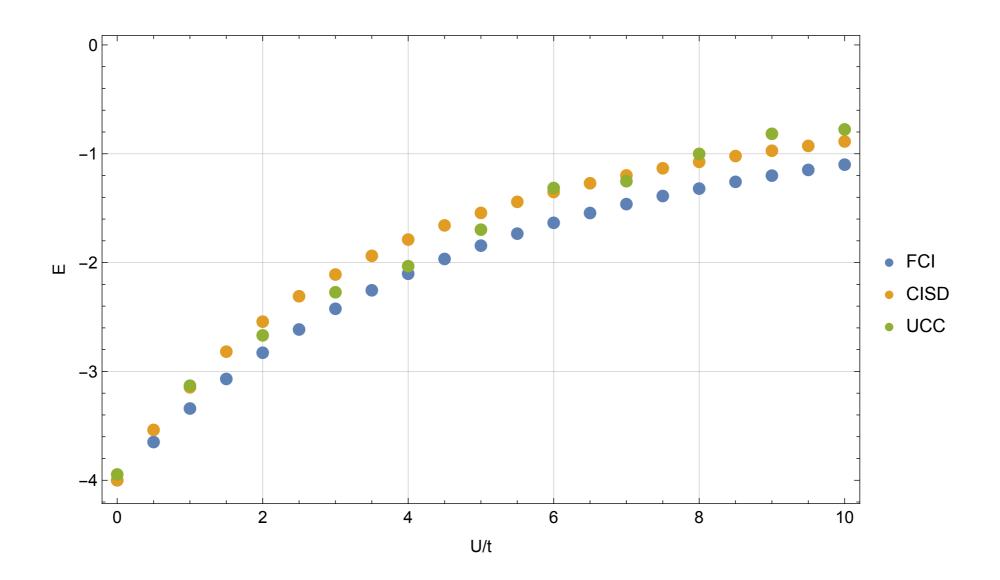


Half-filled case:

2 up spin particles, two down spin particles: 36 states

#### Numerical experiments for a 1-d periodic Hubbard Hamiltonian

$$|\psi\rangle = e^{\hat{T} - \hat{T}^{\dagger}}|0\rangle \qquad T = \sum_{ai} t_i^a a_a^{\dagger} a_i + \sum_{abij} t_{ij}^{ab} a_a^{\dagger} a_j^{\dagger} a_i$$



#### Summary

Classical algorithms are efficient when the electronic structure is well approximated by one occupation number state

Classical algorithms struggle when many occupation number states are required for a qualitatively correct ground state. This is where quantum algorithms will probably have the biggest impact.

This situation occurs in e.g. superconducting materials and clusters of transition metal atoms in the body

Many important topics have not been mentioned:

Excited states for Fermionic systems

Bosonic Hamiltonians for QM of nuclei